Bacterial inoculation manipulates the coral epigenome

Adam R. Barno[1,2], Helena D.M. Villela[1,2], Pedro M. Cardoso[1,2], Francisca C. García[1,2],

Guoxin Cui[1], Nathalia Delgadillo-Ordoñez[1,2], Alexandre S. Rosado[1,2], Torsten Thomas[3],

Manuel Aranda[1], Christian R. Voolstra[4], Raquel S. Peixoto *[1,2]

[1] Red Sea Research Center, Division of Biological and Environmental Science and

Engineering, King Abdullah University of Science and Technology, Thuwal, 23955,

Kingdom of Saudi Arabia

[2] Computational Bioscience Research Center, Division of Biological and Environmental

Science and Engineering, King Abdullah University of Science and Technology, Thuwal,

Kingdom of Saudi Arabia

[3] Centre for Marine Science and Innovation, School of Biological, Earth and

Environmental Sciences, University of New South Wales, Australia

[4] Department of Biology, University of Konstanz, Konstanz, Germany

* Correspondence: Raquel S. Peixoto, raquel.peixoto@kaust.edu.sa

Keywords: climate change, pathogens, coral probiotics, Beneficial Microorganisms for

Corals (BMCs), microbiome manipulation, DNA methylation

Summary

Environmental shifts can elicit epigenetic modifications in corals, which regulate gene expression and physiology, though it remains unclear if associated bacteria can also induce such changes. Here, we inoculated nubbins of the coral *Pocillopora verrucosa* with an opportunistic pathogen, *Vibrio coralliilyticus*, and/or a coral probiotic, *Cobetia* sp., and subjected the nubbins to heat stress. We discovered that the epigenomes responded already after 19 days to heat stress and 28 days to bacterial inoculation. Pathogen stress led to DNA methylation changes not seen in other treatments. Notably, the coral probiotic was able to mitigate specific epigenetic changes in a glutamate receptor pathway, and this correlated with increased stress resilience and higher survival rates of the corals. Importantly, epigenetic marks persisted even after the temperature stress was removed, suggesting epigenome acclimation. Thus, bacterial-induced changes to the coral epigenome may instigate long-term changes in host resilience.

Main

Recent work has shown that beneficial bacteria (probiotics) can increase coral health and resilience in response to stress caused by pathogens, increased temperature, and oil spills[1-7]. This is because corals are holobionts that rely on their associated symbiotic microbes for proper functioning and resilience[8-10]. For example, inoculation of the coral *Pocillopora damicornis* with beneficial microorganisms for corals (BMCs) consisting of bacteria from the genera *Yangia*, *Roseobacter*, *Phytobacter*, and *Salinicola*, correlated with increases in energy reserves and calcification rates[11]. Furthermore, administration of BMCs during and after heat stress increased transcription of genes involved in recovery and stress attenuation and decreased those related to inflammatory and innate immune responses in the coral *Mussismilia hispida*[5]. These changes also correlated with improved coral survival and increased photosynthetic efficiency in the associated symbiotic microalgae (i.e., Symbiodiniaceae)[5]. High temperatures, though, can also lead to dysbiosis and increased establishment of opportunistic pathogens, causing coral bleaching and death[5,12]. For example, inoculation with the temperature-dependent coral pathogen *Vibrio coralliilyticus* brought about a reduction in the skeletal density and abnormal crystal morphology in *P. damicornis*[3]. This could be attenuated by inoculation with a BMC consortium composed of bacteria from the genera *Pseudoalteromonas*, *Cobetia*, and *Halomonas*[3], showing the protective capacity of BMCs against pathogens as well as temperature stress.

Coral-associated microorganisms have recently been posited to have the ability to alter

coral epigenomes, thus modifying phenotypic responses[13]. The most commonly studied

epigenome modification in corals is DNA methylation, which, depending on the location

of the methylated bases, prevents transcriptional noise and increases fidelity[14-16]. The

interaction between coral epigenomes and their symbionts was recently demonstrated by

exchanging the Symbiodiniaceae strain in the coral *Montastraea cavernosa* and applying

thermal stress, which together produced changes in DNA methylation[17]. Exchanging or

manipulating bacterial symbionts may have similar impacts on the coral host. These

impacts could be either indirect, by changing the nutritional status or altering metabolic

capacities[10], or direct, by producing metabolites that act as cofactors for epigenome-

modifying enzymes[18] or encoding proteins that are homologs of bacteria-produced

proteins capable of inducing epigenomic changes in mammals[13].

Here, we sought to determine whether inoculation with bacteria leads to changes in the

coral epigenome that align with improved resilience to thermal stress. To do this, we

regularly inoculated *P. verrucosa* nubbins with either a BMC (*Cobetia* sp.; hereafter

"*Cobetia*"), a temperature-dependent pathogen (*V. coralliilyticus* BAA-450; hereafter

"*Vibrio*"), or both bacteria (hereafter "Both"), and subjected the corals to a temperature

stress regime (from 27 °C to 33 °C), followed by a recovery period. Heat-stressed corals

are hereafter denoted with "H_", whereas corals kept at ambient temperature throughout

the experiment are denoted with "A_". The mesocosm experiment encompassed 28 days,

with samples taken before any treatment was applied (T0 = day 0), at the peak of the heat

stress (T1 = day 19), and after a recovery period (T2 = day 28). DNA methylation

differences at the gene level were analyzed and linked to increases in the abundance of

the respective inocula and coral phenotypic responses, to show that bacterial inoculation,

in combination with temperature stress, can modulate the coral epigenome. Through co-

inoculation of a probiotic and pathogen, we could further show that indicators of stress

seen in the pathogen-inoculated corals were reduced with the co-inoculated BMC. This

pattern could be observed in all components of the holobiont (host phenotype, host

epigenome, symbiont photosynthetic efficiency, and microbiome) and prospects probiotic

therapy as prevention of epigenomic disturbances caused by pathogenic infection.

Probiotic inoculation increases coral resilience

Cobetia inoculation positively affected coral resilience to temperature stress during a

recovery period after high-temperature exposure. The photosynthetic efficiency (*Fv/Fm*

values measured by Diving-PAM II) was significantly lower in heat-stressed corals than

in ambient temperature corals at T1 (*Wilcoxon Rank Sum*: $W = 256$, $p < 0.001$) and T2

(*Wilcoxon Rank Sum*: $W = 248$, $p < 0.001$) (Fig. 1A and Supplementary Table 1a). The

Fv/Fm values were not significantly different between treatment groups in either the

ambient temperature corals (*Kruskal-Wallis*: $X^2 = 4.87$, df $= 3$, $p = 0.182$) nor the heat-

stressed corals (*Kruskal-Wallis*: $X^2 = 3.97$, df $= 3$, $p = 0.265$) at T2. However, similar to

previous findings (Rosado et al., 2019), the combination of heat stress and *Vibrio*

inoculation (H_*Vibrio*) resulted in significantly more paling (*Kruskal-Wallis*: $X^2 = 8.49$,

df $= 3$, $p = 0.037$; *Dunn test*: $p = 0.043$; Fig. 1B) and tissue loss (*Kruskal-Wallis*: $X^2 =$

10.08, df $= 3$, $p = 0.018$; *Dunn test*: $p = 0.014$; Fig. 1C) when compared to the control

group (H_Control) after the recovery period (T2) (Supplementary Table 1b). Notably,

both the color intensity and percentage of live tissue in all other treatments within the

same temperature regime, including the co-inoculation treatment, were indistinguishable

from each other (Fig. 1B-C). Although the *Vibrio*-inoculated coral nubbins were paler

than the nubbins from the other experimental groups at T2 in the heat-stressed corals, the

color intensities of the live tissue remaining on the coral nubbins were not significantly

different (*Kruskal-Wallis*: X^2 = 7.48, df = 3, p = 0.058; Extended Data Fig. 1).

Fig. 1. Coral phenotypic response and inoculated bacteria abundances throughout the experiment.
(A) Mean photosynthetic efficiency (*Fv/Fm* ratios; y axis) from coral nubbins during the
mesocosm experiment days (x axis). The error bars represent standard deviations (n = 4). (B)
Average color intensity and (C) percent live tissue of the coral nubbins in each condition, as
measured by ImageJ. Lines represent the mean value for each condition, and the error bars
represent standard deviations. T2 H_Vibrio corals were significantly different from the heat-
stressed control (H_Control) corals in both color intensity and percent live tissue (*). Color
intensity was measured on the CoralWatch Coral Health Chart[19] for reference. Percent
abundances are shown in boxplots of the bacterial inoculums (*Cobetia* sp. (D) and *V.*

coralliilyticus (E)) across treatments and sampling times show significant differences between
Cobetia sp. abundances at T1 and T2 and between *V. coralliilyticus* abundances at T1 and T2.
Boxplots display the individual data points, medians, lower and upper quartiles, and whiskers
displaying the 1.5x interquartile range. Abundances of each inoculum were compared between
each treatment group (i.e., Control, *Cobetia*, *Vibrio*, Both) within each temperature condition
(i.e., ambient temperature or heat-stressed). Asterisks denote significant differences between two
groups within a timepoint (p < 0.05).

The differences in color intensity and tissue loss observed in the coral nubbins at T2

between the control group and the *Vibrio* treatment in the heat-stressed corals may be due

to the establishment of the pathogen in the heat-stressed samples at T1 (Fig. 1D-E and

Supplementary Table 2). Using 16S rRNA gene analysis, we found that the relative

abundance of *V. coralliilyticus* was significantly higher in the corals treated with the

pathogen than the control treatment at T1 (*Kruskal-Wallis*: X^2 = 13.059, df = 3, p = 0.005;

Dunn test: p = 0.002) and T2 (*Kruskal-Wallis*: X^2 = 11.647, df = 3, p = 0.009; *Dunn test*:

p = 0.045). Interestingly, the *V. coralliilyticus* abundance was lower at T2 than T1, which

may be a sign of successional changes in the microbiome coinciding with disease

progression[20], although data in this area is lacking. Overall, the co-inoculation with the

BMC was able to mitigate *Vibrio* establishment in the microbiome during the peak of

stress at T1, and controlled the relative abundance *Vibrio* to similar degree at T2.

Moreover, the co-inoculation had a positive impact on the phenotype in heat-stressed

corals at T2, contributing to the increased stress resilience and survival observed in this

treatment.

The protective capacity of coral-associated bacteria, and probiotics in particular, to

pathogen stress has been recently demonstrated by a single bacterium,

Pseudoalteromonas sp. strain McH1-7, stopping or slowing the progression of stony

coral tissue loss disease in *Montastraea cavernosa* fragments[7]. The authors hypothesized

that the disease suppression was due to antibacterial compounds produced by the

bacterium[7]. Likewise, a single bacterial strain, *Phaeobacter* sp. BS52, was able to protect

the seaweed *Delisea pulchra* from a pathogen-induced bleaching disease[21]. Although

Phaeobacter sp. BS52 was found to be antagonistic towards pathogens, its ability to

prevent dysbiosis was determined to be a main factor in blocking disease progression[21].

In both of these recent examples, the protective capacity of the probiotic was attributed to

its interactions with other bacteria, independent of interactions with the host. In this

experiment, microbiome differences were also observed between temperature groups, as

well as bacteria treatment groups within each temperature condition (Extended Data Fig.

2 and 3, Supplementary Table 3a and 3b), which supports the concept that attenuation of

pathogen-derived dysbiosis boosts coral resilience.

Coral epigenomes respond quickly to temperature stress and bacterial inoculation

To explore whether the stress mitigation in co-inoculated coral nubbins was also

attributed to interactions with the coral epigenome, genome-wide differences in DNA

methylation were analyzed in response to temperature stress, bacterial inoculation, and

their interaction. The profile of median methylation levels of genes across the genome of

P. verrucosa were plotted on non-metric multidimensional scaling (nMDS) plots at each

timepoint, and the significance of each factor was determined (Fig. 2, Supplementary

Table 4a). Significant differences existed at the peak of stress (T1) between corals

exposed to the heat stress and those that were not (*PERMANOVA*: $R^2 = 0.107$, $F = 3.245$,

p = 0.001; *PERMDISP*: p = 0.981), showing that methylation marks can change after

twelve days of constant exposure to temperature stress (and 19 days of experimentation).

This is noteworthy, as although epigenome modifications, and DNA methylation

specifically, have been shown to be reactive to environmental changes[15,17,22-25], correlate

with phenotypic acclimatization[15,25], and be heritable[26], it is not known how quickly the

epigenome can react to these changes. Plasticity of DNA methylation in corals has been

tested on the scale of weeks[25,27] and months[17,23,24,28] to a year or more[14,15,22,28], with the

shortest timescale in which DNA methylation changes has been observed being 40

days[25]. Thus, the findings here, that 12 days of heat stress can induce DNA methylation

changes across the genome, represent a novel benchmark in coral epigenome research.

The difference between samples subjected to different temperature conditions was also

observed after 9 days of recovery (28 days total; T2) (*PERMANOVA*: $R^2 = 0.061$, $F =$

1.955, p = 0.002; *PERMDISP*: p = 0.399). Additionally, timepoint was a significant

factor in separating the heat-stressed corals using genome-wide DNA methylation levels,

and pairwise comparisons showed significant differences between each of T0-T1, T1-T2,

and T0-T2 (Extended Data Fig. 4). Bacteria inoculation treatments also significantly

contributed to the separation of samples at T2 (*PERMANOVA*: $R^2 = 0.112$, $F = 1.197$, p =

0.028; *PERMDISP*: p = 0.412), but there was not statistical support for the interaction

between temperature and bacteria treatments (*PERMANOVA*: $R^2 = 0.106$, $F = 1.133$, p =

0.106). Pairwise comparisons showed that pathogen-inoculated corals were significantly

different from the control corals (*PERMANOVA*: $R^2 = 0.101$, $F = 1.456$, p = 0.029), but

there was no pairwise significance between any of the other treatments at T2

(Supplementary Table 4b). The effects of bacterial inoculation on coral DNA methylation

patterns after 28 days and the continued difference in these patterns due to heat stress

after 19 days and 28 days exemplifies persistence of epigenome modifications brought

about by environmental change. Furthermore, these observations demonstrate that DNA

methylation patterns can directly respond to active manipulation, which remains distinct

from initial epigenetic marks even after temperature stress is removed.

Fig. 2. Non-metric MultiDimensional Scaling (nMDS) plots based on Bray-Curtis dissimilarities
of the median methylation levels of genes across the genome of *P. verrucosa*. There was no
significant difference between temperatures and treatments at T0. (B) There was a significant
difference between the ambient temperature treatments (blue) and the high temperature
treatments (orange) at (B) the peak of stress (T1) and (C) after recovery (T2). (D) There was also
a significant effect of treatment at T2. Pairwise comparisons revealed that the Control group and
Vibrio group were significantly different. Circles = 95% confidence intervals around temperature
treatments.

Recently, the concept of "epigenetic memory", where intragenerational differences

between epigenomes of different individuals lead to vertical transmission of distinct

epigenomes, was confirmed in the brain coral *Platygyra daedalea*[26]. This concept,

however, has been recognized in plants for many years (reviewed in [29]). Here, the

changes in epigenomes driven by environmental differences, as well as bacterial

inoculations, signify the potential for long-term persistence after removal from

environmental stress and show promise for microbiome manipulation experiments with

implications for heritable variation in coral resilience.

Pathogen inoculation leads to changes in gene methylation

The significant genome-wide differences in median methylation levels observed between

the temperature conditions at T1 and the temperature conditions and bacteria treatment

groups at T2 (Fig. 2) were further investigated using pairwise generalized linear models

(GLMs). A total of 932 genes were significantly associated with temperature differences

at T1, and 313 genes were significantly associated with the different temperature groups

at T2 (Extended Data Fig. 5, Supplementary Table 5a and 5b). At T2, 17 genes were

found to be significantly influenced by *Vibrio* treatment in comparison to the control

group, 15 of which had depleted median methylation levels correlated with *Vibrio*

inoculation (Supplementary Table 5c). Extending the comparison of these 17 genes to the

other treatment groups using hierarchical clustering based on Euclidean distances shows

that coral nubbins inoculated with *Vibrio* form an outgroup from the other three

conditions at T2 (Fig. 3). These results corroborate the stressed physiological response of

the coral nubbins caused by *Vibrio* inoculation observed at T2 (Fig. 1B-C). This also

demonstrates that, although pathogen inoculation significantly alters coral DNA

methylation, co-inoculation of the pathogen and BMC leads to methylation patterns

similar to the control group, evidencing the BMC's ability to negate impacts caused by

pathogen stress on coral health.

GO:ID	Enriched biological process found in cluster β
GO:0072673	lamellipodium morphogenesis
GO:0034498	early endosome to Golgi transport
GO:0035871	protein K11-linked deubiquitination
GO:0035627	ceramide transport
GO:0035520	monoubiquitinated protein deubiquitination
GO:0007196	adenylate cyclase-inhibiting G protein-coupled glutamate receptor signaling pathway
GO:0070212	protein poly-ADP-ribosylation
GO:0007097	nuclear migration
GO:0002181	cytoplasmic translation
GO:0036297	interstrand cross-link repair
GO:0008053	mitochondrial fusion
GO:0006282	regulation of DNA repair
GO:0035082	axoneme assembly
GO:0051966	regulation of synaptic transmission, glutamatergic

Fig. 3. Genes with median methylation levels significantly associated with *Vibrio* treatment
according to GLMs comparing samples from treatment groups at T2. There is a separation
between the corals inoculated with *V. coralliilyticus* and the other treatments (x-axis).
Hierarchical clustering was performed using Euclidean distances and the "ward.D2"
agglomeration method. Colors represent the z-score for any given gene. The enriched GO terms
using TopGO display the significant functions with depleted methylation levels in pathogen-
stressed corals (cluster β). All enriched GO terms are in Supplementary Table 6c.

Increases in gene body methylation reduce spurious transcription in highly expressed

genes, thereby reinforcing the epigenetic control of genes as expression increases[14-16].

Our findings here revealed that methylation within *P. verrucosa* occurred primarily

within the gene body (Extended Data Fig. 6, Supplementary Table 9). Genes with

depleted methylation in the corals treated with *Vibrio* only (cluster β in Fig. 3) highlight

the link between pathogen stress and diminished epigenetic control of genes involved in

cell maintenance and functioning and genes related to the immune system, which

potentially correlates with decreased gene expression.

The GO terms "protein K11-linked deubiquitination", "monoubiquitinated protein

deubiquitination", "adenylate cyclase-inhibiting G protein-coupled glutamate receptor

signaling pathway", "cytoplasmic translation", "axoneme assembly", and "regulation of

synaptic transmission (glutamatergic)" all function in the metabolic and cellular

processes of the coral cell. Both the "adenylate cyclase-inhibiting G protein-coupled

glutamate receptor signaling pathway" and the "regulation of synaptic transmission

(glutamatergic)" functions rely on the neurotransmitter glutamate. Glutamate production

is necessary for algal symbiosis in the cnidarian model *Aiptasia*[30]. Moreover, in the coral

Stylophora pistillata, heat stress was found to disrupt glutamate biosynthesis and trigger

glutamate catabolism, which contributed to coral bleaching[31]. Therefore, pathogen

inoculation may exacerbate losses in glutamate caused by heat stress by reducing the

epigenetic control of glutamatergic signal transduction. This may be further supported by

significant differences at T2 in the GO term "glutamatergic synapse" (GO:0098978) due

to temperature conditions (Supplementary Table 6b), although additional research in this

area is necessary, as heat stress did not induce uniform methylation trends in all of the

affected glutamatergic synapse genes (Extended Data Fig. 7).

Another group of genes, which have roles in the coral immune system, showed depleted

median methylation levels due to *Vibrio* inoculation treatment. These include genes

defined as "lamellipodium morphogenesis", "early endosome to Golgi transport", and the

well-known stress response mechanisms "interstrand cross-link repair" and "regulation of

DNA repair". Lamellipodia, and by association "lamellipodium morphogenesis", control

interactions with the algal symbiont Symbiodiniaceae[32] and contribute to wound healing

in vertebrates and invertebrates, which has been demonstrated in the cnidarian *Clytia*

hemisphaerica[33]. The reduction in DNA methylation of "early endosome to Golgi

transport" is also consistent with previous research, as endosomal pathways are targeted

by *Vibrio* during infection to evade host defenses and increase the survival of the

bacterium[34]. Specifically, toxins produced by *V. coralliilyticus* cause the disruption of

endosome development and downregulation of immune genes in the host[34,35].

Together, this suggests a depletion in the methylation of genes related to metabolic and

cellular processes and immune responses in pathogen-stressed corals, which could be a

result of downregulation of specific genes observed to be affected by *Vibrio* virulence[36].

Alternatively, pore forming toxins may both modulate epigenetic machinery and disrupt

host signaling pathways, as has been documented in humans[37]. The altered methylation

patterns in *Vibrio*-inoculated corals further indicate the ability of *Vibrio* to manipulate the

coral host defense genes, and the lack of difference in methylation patterns between co-

inoculated corals and the other treatments show the probiotic's ability to mitigate the

Vibrio's effect on the coral epigenome.

Gene methylation differences are correlated with phenotypic response

To determine which genes affected by *Vibrio* inoculation (Fig. 3) correlated most with

the paling and tissue loss observed in the corals (Fig. 1), linear models were implemented

using the median methylation levels and color intensity as factors (Supplementary Table

7). The genes showing the highest correlation between methylation percentage and

phenotypic response ($R^2 > 0.100$ and $p < 0.05$) were g16333, g1533, g17345

, g14350, and g8986 (Fig. 4). The GO terms describing these genes were "negative

regulation of transcription by RNA polymerase II" (GO:0000122), N/A, "ceramide

transport" (GO:0035627), "adenylate cyclase-inhibiting G protein-coupled glutamate

receptor signaling pathway" (GO:0007196), and "cilium movement" (GO:0003341),

respectively. Of the genes with defined functions, three are related to cellular processes,

while g17345 ("ceramide transport") functions in macromolecule localization within the

cell. In all of the defined genes, *Vibrio*-inoculation led to a significant depletion in DNA

methylation when compared to the control group in either the ambient temperature or

heat-stressed conditions. Interestingly, in all but one gene (g16333), co-inoculation with

Cobetia prevented similar decreases in DNA methylation when compared with the

control group.

Fig. 4. Methylation profiles of genes with significant correlations ($R^2 > 0.100$, $p < 0.05$) between
methylation levels and phenotypic response (coral nubbin color intensity). Linear regression plots
show the correlation lines of the coral nubbin color intensity to the median methylation percent in
each sample along with the 95% confidence intervals (shaded regions). Boxplots showing the
median methylation percent of the samples at T2 (after recovery), were used to compare between
treatments with one-way ANOVA, followed by TukeyHSD. Asterisks denote significance
between treatment groups in the boxplots ($p < 0.05$). Boxplots display the individual data points,
medians, lower and upper quartiles, and whiskers displaying the 1.5x interquartile range. The
effect of *Vibrio*-inoculation was mitigated in the co-inoculated corals in the heat-stressed
conditions in three of these genes.

The gene g14350, defined by the GO term "adenylate cyclase-inhibiting G protein-

coupled glutamate receptor signaling pathway", had significantly lower median

methylation levels in *Vibrio*-treated corals when compared with the control group in the

ambient temperature conditions and the co-inoculation group in the heat-stressed

conditions. As discussed above, the neurotransmitter glutamate mediates interactions

between corals and their algal symbionts[30]. Interestingly, glutamate receptor inhibition

leads to disruption of this association[38]. Thus, the decrease in epigenetic control over this

glutamate receptor pathway due to pathogen stress may similarly interfere with algal

symbiosis, which correlates with diminished coral health.

When analyzing the methylation levels of the genes and putative functions, we can

conclude that *Vibrio* inoculation caused changes to methylation levels in metabolic and

cellular processes, which corresponded with phenotypic responses (Fig. 1). The

difference between the *Vibrio*-inoculated corals and the other three conditions (control,

inoculation with *Cobetia* sp., and the co-inoculation) in these genes at T2 demonstrates

the coral probiotic's ability to prevent changes to the coral epigenome in key functions

altered by the pathogen (*V. coralliilyticus*). This effect was associated with increased

resilience to stress and higher survival rates.

The direct mechanisms by which bacteria are able to elicit changes to the coral

epigenome are still to be explored, although metabolites and proteins produced by coral-

associated bacteria are suggested to play a role[13,18]. Additionally, the crosstalk between

coral epigenomes and coral-associated bacteria may not be unidirectional, as pathogen

susceptibility has been hypothesized to be at least partly controlled by epigenetic factors

in aquaculture fish[39]. By connecting rapid microbiome changes to more long-term and

heritable epigenetic changes (Fig. 5), bacteria inoculation has the potential to induce

lasting differences, even without direct establishment in the bacterial community. Thus,

as future studies explore this interaction further, the current paradigm that microbiome

interventions only lead to short-term and volatile changes[40] might shift.

361
Fig. 5. Rethinking the flexibility and longevity of coral microbiomes via crosstalk with coral
epigenomes. Microbiome changes occur quickly and are fleeting. However, relating microbiome
manipulation and coral DNA methylation here shows that bacterial community changes may
induce long-term and possibly heritable changes in corals by influencing modifications to the
coral epigenome. This figure highlights the transformative nature of our results by adding an
"arrow" to the previous concept postulated in ref.[41], connecting the bacterial community with
epigenetic modification.
369

Conclusions

Although hypothesized, the interaction between changes in the coral-associated

microbiome and the coral epigenome was yet to be demonstrated[13,18]. The findings of this

study are fourfold, as we show that, in corals, (1) alterations in DNA methylation can

readily be found after 19 days in different environmental conditions; (2) bacterial

inoculation, as well as temperature stress, contribute to differences in DNA methylation;

(3) pathogen inoculation causes changes in DNA methylation to specific cellular

processes and immune responses; and (4) a single coral probiotic (*Cobetia* sp.) can

mitigate changes in DNA methylation of specific genes and the phenotypic response

induced by pathogen inoculation (with *V. coralliilyticus*). These results have the potential

to influence how customized microbiome rehabilitation experiments[42,43] is utilized for

increasing resistance and resilience in vulnerable corals.

Methods

Coral collection and experimental setup

In order to prevent intergenomic variability would obfuscate identification of methylation marks[44], clonal fragments from *Pocillopora verrucosa* were collected from the Al Fahal reef in the central Red Sea (22˚ 18.3071' N, 38˚ 57.8741' E) on 14 March 2022 (*in situ* seawater temperature = 25˚C) and brought to the aquariums at the Coastal and Marine Resources Core Lab (CMR) in King Abdullah University of Science and Technology (KAUST). All coral husbandry and experimentation was done under the supervision of KAUST's Institutional Biosafety and Bioethics Committee (IBEC). The coral colony was acclimated to CMR conditions (using a 300 L open-system aquarium tank, with a maximum intensity of 180 μmol of photons m−2 s−1 between 10:00 to 14:00, and a 12-hour day/night cycle changing at 7:00 and 19:00) and brought to 27˚C over the course of three weeks (approximately 0.5˚C increase every two days, followed by two weeks at 27˚C). Corals were further fragmented into finger-sized nubbins on 4 April 2022. After a five-week recovery period, nubbins were divided into the eight experimental tanks which housed the replicates for each treatment group (10 L aquarium tanks, using the same light parameters as the acclimation tank above) containing 0.22 µm filtered seawater. The coral nubbins were acclimated for seven days (until the average *Fv/Fm* ratio, a measure for photosynthetic efficiency and proxy for coral health, from the coral nubbins in each experimental tank was >0.600, using a Diving-PAM II; Walz, Germany).

The bacteria used in the experiment were the BMC *Cobetia* sp. (isolated from

Pocillopora verrucosa[45]) and the opportunistic pathogen *Vibrio coralliilyticus* BAA450

(isolated from *Pocillopora damicornis*[46]). The bacteria cultures used in this experiment

were grown using Marine Broth 2216 (Becton Dickinson, USA) for 24 hours at 27˚C

before each inoculation. To minimize additional carbon input from the culture media, the

cultures were spun at 6000 x g for 5 min and the bacteria pellets were resuspended in

sterilized 3.5% NaCl solution. This process was repeated for a total of two washes, then

the bacteria were resuspended in sterilized 3.5% NaCl solution for inoculation.

Abundance and purity of each of the cultures were checked by the plate counting method

using Marine Agar 2216 (Becton Dickinson, USA).

Starting on day 1, bacteria were inoculated into each of the treatment tanks every three

days at a final concentration of 10^5 cells/mL. Thirty percent of the water was replaced

with new 0.22 µm filtered seawater (kept at the same temperature of the experimental

tanks) every other day. The experiment was performed over 28 days. Of the eight

experimental tanks, four were maintained at 27˚C throughout the entirety of the

experiment (denoted with an "A" for ambient temperature). In the other four

experimental tanks, starting from day 1, temperature was increased from 27˚C to 33˚C

(by increasing the temperature 1˚C per day for 6 days), then maintained at 33˚C for 12

days (until the average *Fv/Fm* across all conditions was <0.450), then returned to 27˚C

(by decreasing the temperature 1˚C per day) where they were kept until the end of the

experiment (4 days). These tanks are denoted with an "H" for heat stress. The four

experimental tanks in each of A or H, contained one of the following experimental

conditions: corals with no inoculation ("Control"), corals inoculated with *Cobetia* sp. at a

final concentration of 10^5 cells/mL ("*Cobetia*"), corals inoculated with *V. coralliilyticus*

at a final concentration of 10^5 cells/mL ("*Vibrio*"), and corals inoculated with both

Cobetia sp. and *V. coralliilyticus*, each at a final concentration of 10^5 cells/mL ("Both").

In total the eight conditions were: A_Control, A_*Cobetia*, A_*Vibrio*, A_Both, H_Control,

H_*Cobetia*, H_*Vibrio*, and H_Both.

Samples of four coral nubbin replicates (n = 4) per tank were taken at the start of the

experiment before any bacterial inoculation (T0), on day 19 (peak of stress, T1), and on

day 28 (after recovery, T2). At each sampling time, the apical tip of the sampled nubbin

was removed and flash frozen in liquid nitrogen for nucleic acid analysis. Frozen nubbins

were then transferred to -80˚C until processing.

Coral health parameters

Coral health was monitored during the experiment using a Diving-PAM II (Walz,

Germany) to measure the *Fv/Fm* ratios. *Fv/Fm* measurements were taken after dark

acclimating the coral nubbins for at least 1 hour the night before each inoculation day

(every three days starting on day 0) throughout the entirety of the experiment (n = 4 for

each experimental tank). Images were taken of the coral nubbins at T0 and at their

respective sampling times (T1 or T2).

ImageJ was used to analyze the percent live tissue, color intensity, and color intensity of

live tissue of each of the images of the nubbins from sampling times T0 (n = 12 for each

treatment), T1 (n = 4 for each treatment), and T2 (n = 4 for each treatment). For the

percent live tissue, the area of live tissue on the coral nubbin was divided by the total area

of the coral nubbin in each respective image. The color intensity was measured by first

converting each image to grayscale and measuring the unweighted average in color

intensity (from 0 = black, to 255 = white) incorporating the whole image of the coral

nubbin. Thus, a lower average color intensity would represent healthier living tissue, and

a higher color intensity would represent pale, bleached, or dead coral tissue. This, then,

incorporates the color of the live tissue and any exposed coral skeleton that may be

present in coral nubbins with tissue loss. For the color intensity of live tissue, only the

unweighted average in color intensity observed in the live tissue portion of the image was

considered. Percent live tissue, color intensity, and color intensity of live tissue

measurements were compared between the samples with Kruskal-Wallis H tests[47],

followed by Dunn's multiple comparison test[48] using Benjamini-Hochberg adjustment.

16S rRNA gene amplicon sequencing

DNA was extracted from airbrushed coral tissue using AllPrep DNA/RNA Mini Kit

(Qiagen, Germany), following manufacturer's instructions. Extracted DNA was used for

analysis of the bacterial community as well as identification of the methylation marks

within the coral genome. For bacterial community analysis, the DNA composing the V3-

V4 region of the 16S rRNA gene was sent to Novogene (Novogene, China) for

sequencing using a NovaSeq 6000 (Illumina, USA) with the primers 341F (5'-

CCTAYGGGRBGCASCAG-3') and 806R (5'-GGACTACNNGGGTATCTAAT-3').

Library preparation and sequencing of methylated DNA

Libraries of converted methylated DNA were prepared using the NEB Enzymatic

Methyl-seq Kit (New England Biolabs Inc., USA) with the EM-seq Index Primers (New

England Biolabs Inc., USA). Prepared libraries were sent to Novogene (Novogene,

China) for sequencing using a NovaSeq 6000 (Illumina, USA). Due to insufficient DNA

quality in 5 samples, 91 of the 96 samples were used for downstream analysis (n = 4 for

each experimental group; except A_Control at T1; H_Control at T0, T1, and T2; and

H_Both at T1; which all had n = 3).

Coral microbiome data analysis

For microbiome analysis, primer sequences were removed using cutadapt[49]. Sequences

were further filtered and trimmed using the DADA2 pipeline[50]. Taxonomy was assigned

using the SILVA_nr99_v138.1 database[51]. Sequences identified as Bacteria that did not

match to Chloroplast or Mitochondria were further analyzed using phyloseq[52]. ASVs with

a 100% match to the 16S rDNA sequence of the inoculums (*Cobetia* sp. or *Vibrio*

coralliilyticus) via BLASTN[53] were determined to be representative ASVs of the

inoculated bacteria. Statistical differences between relative abundance data in different

groups were determined using the *vegan* package in R (version 4.3.1). Bacterial

abundances were not normally distributed (*Shapiro-Wilk*: $p < 0.05$), so significant

differences between groups were determined by non-parametric tests. Kruskal Wallis H

tests[47], followed by Dunn's multiple comparison tests[48], were used to find significant

differences between treatment groups (n = 4 for each experimental group).

Microbiome composition differences were calculated between treatment groups in each

of the temperature conditions and timepoints using principal coordinate analyses (PCoA).

Significant factors driving the separation between samples and sample dispersion were

determined using the adonis2 and betadisper commands in the *vegan* R package (version

4.3.1). Pairwise differences between treatment groups were tested using the

pairwise.adonis command in the *pairwiseAdonis* R package.

Coral DNA methylation

DNA methylation was analyzed bioinformatically following the steps described in Liew

et al. (2020)[26]. Reads were first trimmed using TrimGalore v0.6.10[49]. Then, the filtered

reads were mapped to a reference genome for *Pocillopora verrucosa*[54] and deduplicated,

before methylation marks were scored per-position using Bismark v0.23.1[55]. Methylated

DNA positions were only considered bona fide if they met the criteria defined in Liew et

al. (2020)[26]. Briefly, the probability of methylated positions resulting from sequencing

error needed to be below 0.05 after correcting for false discovery rate, and the methylated

reads were only kept if the methylation occurred in all replicates of at least one of the

experimental conditions. Also, the median coverage needed to be ≥ 10 and minimum

coverage needed to be ≥ 5 across all of the samples in order to be considered for further

analyses[26] (Supplementary Table 8).

The median methylation levels across genes were compared between groups. Each

methylated position within a given gene was given a score between 0 (no methylation in

any of the cells) to 1 (fully methylated across all cells), and the median across each gene

was used for further analyses. Only genes with five or more methylated positions were

used for downstream analyses. Nonmetric multidimensional scaling (nMDS) plots were

used to compare the median methylation across the genome of the coral using the above

cutoffs. Significant factors driving the separation between samples and sample dispersion

were determined using the adonis2 and betadisper commands in the *vegan* R package

(version 4.3.1). Pairwise differences between treatment groups were tested using the

pairwise.adonis command in the *pairwiseAdonis* R package.

To extrapolate the genes related to the difference observed between the Control treatment

and the *Vibrio*-treated corals at T2, generalized linear models (GLMs) were implemented

in R using the following formula:

glm(median_methylation_levels ~ temperature + treatment, family = gaussian())

for the data from T2, where median methylation levels for each gene was compared with

the predictor variables temperature (ambient vs. heat-stressed) and treatment (by using

the Control treatment as a baseline to compare with each of *Cobetia*-treated, *Vibrio*-

treated, and the co-inoculation treatment samples). Genes with fewer than 5 methylated

positions were removed from the analysis. Genes with *Vibrio* treatment as a significant

predictor variable (after correcting for false discovery rate) were plotted on a heatmap

with all of the T2 samples using hierarchical clustering with Euclidean distances and the

"ward.D2" agglomeration method.

Functional enrichment of differently methylated genes

GO term annotations were collected from the published *P. verrucosa* genome[54]. GO term

enrichment analysis was performed using TopGO[56] on the genes with significantly

different methylation levels from the previous step. Enriched GO terms with $p < 0.05$

and were considered significant.

Correlating median methylation with phenotypic parameters

The genes predicted to be associated with *Vibrio* inoculation in the previous step were

then tested against a phenotypic response variable using linear models with the formula:

559   lm(median_methylation_levels ~ color_intensity, data = gene)

to determine which of these genes correlated with phenotypic differences observed in the

corals affected by temperature and treatment. The genes with $R^2 > 0.100$ and $p < 0.05$

were plotted using linear regressions with 95% confidence intervals. Boxplots showing

the median methylation levels of these genes in each sample at T2 were then used to

compare differences between groups using one-way ANOVA followed by TukeyHSD.

Data availability

EM-seq data is deposited in the NCBI Sequence Read Archive under the BioProject

accession number PRJNA1123499.

Acknowledgements

We would like to thank the Coastal and Marine Resources Lab and Bioscience Core Lab

for their support and assistance throughout the experiment. This work was supported by

KAUST grant number BAS/1/1095-01-01

Author contributions

A.R.B., H.D.M.V., G.C., T.T., M.A., C.R.V., and R.S.P. designed the experiments;

A.R.B., H.D.M.V., P.M.C. conducted the mesocosm experiment and sample collection;

A.R.B. and N.D. performed DNA extractions; A.R.B. and F.C.G. performed analyses;

A.R.B. wrote the manuscript with input from all authors; A.S.R. and R.S.P. provided

guidance and funding during the experiment.

Competing interests

The authors declare no conflicting interests.

Materials & Correspondence

Correspondence to Adam R. Barno or Raquel S. Peixoto.

Supplementary Information

Supplementary tables are provided in excel format.

Extended Data Fig. 1. Color intensity of live tissue for the coral nubbins throughout the
experiment. Lines represent the mean color intensities are plotted for each bacterial treatment
group at each timepoint for nubbins in the (A) ambient temperature condition and (B) heat-
stressed condition, as measured by ImageJ. The error bars represent standard deviations. Color
intensity was measured on the CoralWatch Coral Health Chart[19] for reference.

604
Extended Data Fig. 2. Principle coordinate analysis plots based on Bray-Curtis dissimilarities of
the relative abundances of the total bacterial community in the coral nubbins at each sampling
time. There were significant differences between temperature conditions and bacteria treatments
at all timepoints. Sample dispersion was found to be significant between temperature conditions
at T1 (*PERMDISP*: p < 0.001) and T2 (*PERMDISP*: p < 0.001). Circles = 95% confidence
intervals around temperature conditions.

Extended Data Fig. 3. Principal coordinate analysis (PCoA) plots of microbiome data showing
the separation between treatments using Bray-Curtis dissimilarity between samples in ambient
temperature corals (top) and heat-stressed corals (bottom). In all timepoints but T0 ambient
temperature, the treatments were found to be significantly different. Sample dispersion was not
significant at any of the three timepoints (T0: *PERMDISP*: p = 0.393, T1: *PERMDISP*: p = 0.791,
T2: *PERMDISP*: p = 0.732). There was greater separation between communities based on
bacteria treatment at T1 and T2 then there was at T0. Pairwise comparisons revealed significant
differences between all treatments in heat-stressed corals at T1 and T2. Circles = 95% confidence
intervals around bacteria treatments.

Extended Data Fig. 4. Separation of genome-wide DNA methylation in samples based on
timepoint in ambient temperature corals and heat-stressed corals via nMDS plots using Bray-
Curtis dissimilarity and hierarchical clustering using the ward.D2 method. The DNA methylation
profiles were significantly different between the timepoints in the heat-stressed corals (T0 - T1:
$R^2 = 0.121$, $F = 3.720$, p = 0.003; T0 - T2: $R^2 = 0.071$, $F = 2.131$, p = 0.003; T1 - T2: $R^2 = 0.053$,
$F = 1.526$, p = 0.012). Circles in nMDS plots = 95% confidence intervals around timepoints.

Extended Data Fig. 5. Percent methylation levels of genes significantly driven by temperature conditions (ambient vs. heat stress) at sampling times T1 (left) and T2 (right) as determined by GLMs. Hierarchical clustering was performed using Euclidean distances and the "ward.D2" agglomeration method. Colors represent the z-score for any given gene. All enriched GO terms due to differences in temperature regimes at T1 and T2 are in Supplementary Table 6a and 6b, respectively.

647
648 Extended Data Fig. 6. Genomic context of methylation across genomic regions (a) and along
649 genes (b). Data from all samples (n = 91) were pooled to find where DNA methylation is
650 observed along the *Pocillopora verrucosa* genome. DNA methylation was detected more in genic
651 regions, with higher frequencies of DNA methylation occurring in exons.
652

654 Extended Data Fig. 7. Percent methylation levels of glutamatergic synapse genes significantly
655 driven by temperature conditions (ambient vs. heat stress) at T2 (8 genes total) as determined by
656 GLMs. Hierarchical clustering was performed using Euclidean distances and the "ward.D2"
657 agglomeration method. Colors represent the z-score for any given gene.

References

1. Doering, T. et al. Towards enhancing coral heat tolerance: a "microbiome transplantation" treatment using inoculations of homogenized coral tissues. *Microbiome* **9**, 102 (2021)

2. Fragoso ados Santos, H. et al. Impact of oil spills on coral reefs can be reduced by bioremediation using probiotic microbiota. *Sci. Rep.* **5**, 18268 (2015)

3. Moradi, M. et al. Probiotics mitigate thermal stress- and pathogen-driven impacts on coral skeleton. *Front. Mar. Sci.* **10**, 1212690 (2023)

4. Rosado, P. M. et al. Marine probiotics: increasing coral resistance to bleaching through microbiome manipulation. *ISME J.* **13**, 921–936 (2019)

5. Santoro, E. P. et al. Coral microbiome manipulation elicits metabolic and genetic restructuring to mitigate heat stress and evade mortality. *Sci. Adv.* **7**, eabg3088 (2021)

6. Silva, D. P. et al. Multi-domain probiotic consortium as an alternative to chemical remediation of oil spills at coral reefs and adjacent sites. *Microbiome* **9**, 118 (2021)

7. Ushijima, B. et al. Chemical and genomic characterization of a potential probiotic treatment for stony coral tissue loss disease. *Commun. Biol.* **6**, 248 (2023)

8. Peixoto, R. S., Rosado, P. M., Leite, D. C. de A., Rosado, A. S. & Bourne, D. G. Beneficial Microorganisms for Corals (BMC): Proposed Mechanisms for Coral Health and Resilience. *Front. Microbiol.* **8**, 341 (2017)

9. Reshef, L., Koren, O., Loya, Y., Zilber-Rosenberg, I. & Rosenberg, E. The Coral Probiotic Hypothesis. *Environ. Microbiol.* **8**, 2068–2073 (2006)

10. Rohwer, F., Seguritan, V., Azam, F. & Knowlton, N. Diversity and distribution of coral-associated bacteria. *Mar. Ecol. Prog. Ser.* **243**, 1–10 (2002)

11. Zhang, Y. et al. Shifting the microbiome of a coral holobiont and improving host physiology by inoculation with a potentially beneficial bacterial consortium. *BMC Microbiol.* **21**, 130 (2021)

12. Sweet, M. J. & Bulling, M. T. On the Importance of the Microbiome and Pathobiome in Coral Health and Disease. *Front. Mar. Sci.* **4**, 9 (2017)

13. Barno, A. R., Villela, H. D. M., Aranda, M., Thomas, T. & Peixoto, R. S. Host under epigenetic control: A novel perspective on the interaction between microorganisms and corals. *BioEssays* **43**, 10 (2021)

14. Li, Y. et al. DNA methylation regulates transcriptional homeostasis of algal

endosymbiosis in the coral model Aiptasia. *Sci. Adv.* **4**, 8 (2018)

15. Liew, Y. J. et al. Epigenome-associated phenotypic acclimatization to ocean

acidification in a reef-building coral. *Sci. Adv.* **4**, 6 (2018)

16. Neri, F. et al. Intragenic DNA methylation prevents spurious transcription initiation.

Nature **543**, 72–77 (2017)

17. Rodriguez☐Casariego, J. A., Cunning, R., Baker, A. C. & Eirin☐Lopez, J. M.

Symbiont shuffling induces differential DNA methylation responses to thermal stress

in the coral *Montastraea cavernosa*. *Mol. Ecol.* **31**, 588–602 (2021)

18. Putnam, H. M. Avenues of reef-building coral acclimatization in response to rapid

environmental change. *J. Exp. Biol.* **224**, jeb239319 (2021)

19. Siebeck, U. E., Logan, D. & Marshall, N. J. CoralWatch – a flexible coral bleaching

monitoring tool for you and your group. *Coral Reefs.* (2010)

20. Vega Thurber, R. et al. Deciphering Coral Disease Dynamics: Integrating Host,

Microbiome, and the Changing Environment. *Front. Ecol. Evol.* **8**, 575927 (2020)

21. Li, J. et al. Bacterial controlled mitigation of dysbiosis in a seaweed disease. *ISME J.*

16, 378–387 (2022)

22. Dimond, J. L. & Roberts, S. B. Convergence of DNA Methylation Profiles of the

Reef Coral *Porites astreoides* in a Novel Environment. *Front. Mar. Sci.* **6**, 792 (2020)

23. Dixon, G., Liao, Y., Bay, L. K. & Matz, M. V. Role of gene body methylation in

acclimatization and adaptation in a basal metazoan. *Proc. Natl. Acad. Sci.* **115**,

13342–13346 (2018)

24. Dixon, G. B., Bay, L. K. & Matz, M. V. Bimodal signatures of germline methylation

are linked with gene expression plasticity in the coral *Acropora millepora*. *BMC*

Genomics **15**, 1109 (2014)

25. Putnam, H. M., Davidson, J. M. & Gates, R. D. Ocean acidification influences host

DNA methylation and phenotypic plasticity in environmentally susceptible corals.

Evol. Appl. **9**, 1165–1178 (2016)

26. Liew, Y. J. et al. Intergenerational epigenetic inheritance in reef-building corals. *Nat.*

Clim. Change **10**, 254–259 (2020)

27. Rodríguez☐Casariego, J. A. et al. Coral epigenetic responses to nutrient stress:

Histone H2A.X phosphorylation dynamics and DNA methylation in the staghorn

coral *Acropora cervicornis*. *Ecol. Evol.* **8**, 12193–12207 (2018)

28. Rodríguez-Casariego, J. A. et al. Genome-Wide DNA Methylation Analysis Reveals

a Conserved Epigenetic Response to Seasonal Environmental Variation in the

Staghorn Coral *Acropora cervicornis*. *Front. Mar. Sci.* **7**, 560424 (2020)

29. Turgut-Kara, N., Arikan, B. & Celik, H. Epigenetic memory and priming in plants.

Genetica **148**, 47–54 (2020)

30. Cui, G. et al. Host-dependent nitrogen recycling as a mechanism of symbiont control

in *Aiptasia*. *PLOS Genet.* **15**, e1008189 (2019)

31. Rädecker, N. et al. Heat stress destabilizes symbiotic nutrient cycling in corals. *Proc.*

Natl. Acad. Sci. **118**, e2022653118 (2021)

32. Kawamura, K. et al. *In vitro* Symbiosis of Reef-Building Coral Cells With

Photosynthetic Dinoflagellates. *Front. Mar. Sci.* **8**, 706308 (2021)

33. Kamran, Z. et al. In vivo imaging of epithelial wound healing in the cnidarian *Clytia*

hemisphaerica demonstrates early evolution of purse string and cell crawling closure

mechanisms. *BMC Dev. Biol.* **17**, 17 (2017)

34. Agarwal, S. et al. Autophagy and endosomal trafficking inhibition by *Vibrio cholerae*

MARTX toxin phosphatidylinositol-3-phosphate-specific phospholipase A1 activity.

Nat. Commun. **6**, 8745 (2015)

35. Kimes, N. E. et al. Temperature regulation of virulence factors in the pathogen *Vibrio*

coralliilyticus. *ISME J.* **6**, 835–846 (2012)

36. Vidal-Dupiol, J. et al. Thermal Stress Triggers Broad *Pocillopora damicornis*

Transcriptomic Remodeling, while *Vibrio coralliilyticus* Infection Induces a More

Targeted Immuno-Suppression Response. *PLoS ONE* **9**, e107672 (2014)

37. Heitmueller, M., Billion, A., Dobrindt, U., Vilcinskas, A. & Mukherjee, K.

Epigenetic Mechanisms Regulate Innate Immunity against Uropathogenic and

Commensal-Like *Escherichia coli* in the Surrogate Insect Model *Galleria mellonella*.

Infect. Immun. **85**, e00336-17 (2017)

38. Konciute, M. K. Exploring the Role of Glutamate Signaling in the Regulation of the

Aiptasia-Symbiodiniaceae Symbiosis. *KAUST Research Repository* (2020)

39. Hansen, S. B. et al. Intestinal epigenotype of Atlantic salmon (*Salmo salar*) associates with tenacibaculosis and gut microbiota composition. *Genomics* **115**, 110629 (2023)

40. Garcias-Bonet, N. et al. Horizon scanning the application of probiotics for wildlife. *Trends Microbiol.* S0966-842X(23)00259-7 (2023)

41. Voolstra, C. R. & Ziegler, M. Adapting with microbial help: microbiome flexibility facilitates rapid responses to environmental change. *BioEssays.* **42**, 7 (2020)

42. Peixoto, R. S., Sweet, M. & Bourne, D. G. Customized Medicine for Corals. *Front. Mar. Sci.* **6**, 686 (2019)

43. Peixoto, R. S. & Voolstra, C. R. The baseline is already shifted: marine microbiome restoration and rehabilitation as essential tools to mitigate ecosystem decline. *Front. Mar. Sci.* **10**, 1218531 (2023)

44. Dixon, G. & Matz, M. Benchmarking DNA methylation assays in a reef-building coral. *Mol. Ecol. Resour.* **21**, 464-477 (2021)

45. Delgadillo-Ordoñez, N. et al. Probiotics reshape the coral microbiome in situ without affecting the surrounding environment. *Research Square* (2023)

46. Ben-Haim, Y. et al. *Vibrio coralliilyticus* sp. nov., a temperature-dependent pathogen of the coral *Pocillopora damicornis*. *Int. J. Syst. Evol. Microbiol.* **53**, 309–315 (2003)

47. Kruskal, W. H. & Wallis, W. A. Use of ranks in one-criterion variance analysis. *J. Am. Stat. Assoc.* **47**, 583–621 (1952)

48. Dunn, O. J. Multiple Comparisons Using Rank Sums. *Technometrics* **6**, 241–252 (1964)

49. Martin, M. Cutadapt removes adapter sequences from high-throughput sequencing reads. *EMBnet.journal* **17**, 10–12 (2011)

50. Callahan, B. J. et al. DADA2: High-resolution sample inference from Illumina amplicon data. *Nat. Methods* **13**, 581–583 (2016)

51. Quast, C. et al. The SILVA ribosomal RNA gene database project: improved data processing and web-based tools. *Nucleic Acids Res.* **41**, D590–D596 (2013)

52. McMurdie, P. J. & Holmes, S. phyloseq: An R Package for Reproducible Interactive Analysis and Graphics of Microbiome Census Data. *PLoS ONE* **8**, e61217 (2013)

53. Altschul, S. F., Gish, W., Miller, W., Myers, E. W. & Lipman, D. J. Basic Local Alignment Search Tool. *J Mol Biol* **215**, 403–410 (1990)

54. Buitrago-López, C., Mariappan, K. G., Cárdenas, A., Gegner, H. M. & Voolstra, C.
R. The Genome of the Cauliflower Coral *Pocillopora verrucosa*. *Genome Biol. Evol.*
12, 1911–1917 (2020)
55. Krueger, F. & Andrews, S. R. Bismark: a flexible aligner and methylation caller for
Bisulfite-Seq applications. *Bioinformatics* **27**, 1571–1572 (2011)
56. Alexa, A., Rahnenführer, J. & Lengauer, T. Improved scoring of functional groups
from gene expression data by decorrelating GO graph structure. *Bioinformatics* **22**,
1600–1607 (2006)
790
791